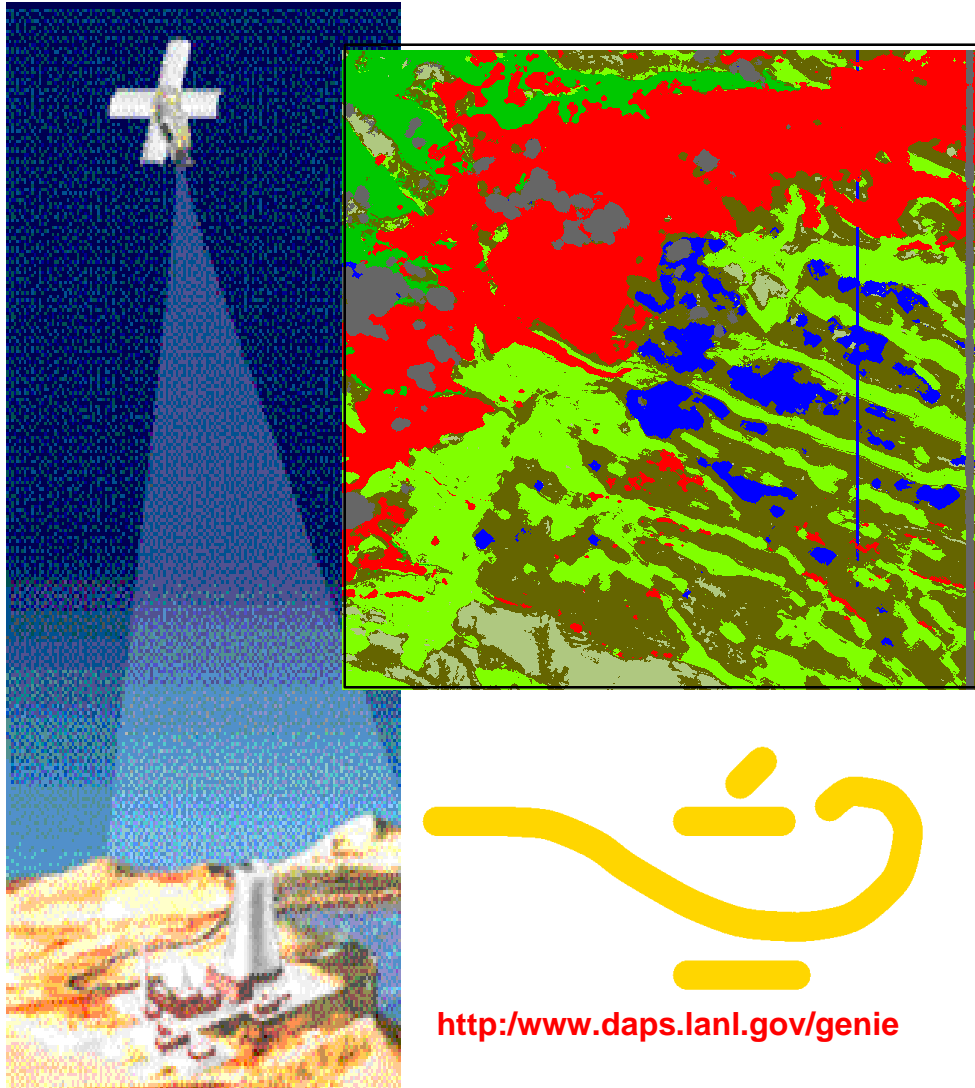




# ***Rapid Feature Identification Project***



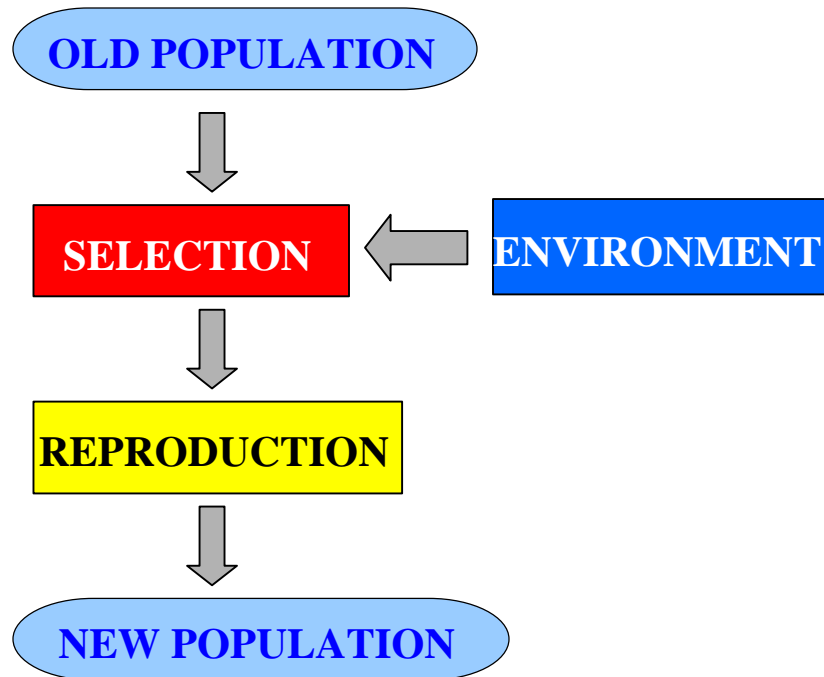
<http://www.daps.lanl.gov/genie>

- Adaptive Algorithms for Multispectral Imagery
- Automated Evolution of New Image Analysis Tools
  - Allows Expert Assistance
  - Incorporates Existing Tools
  - Uses Spatio-Spectral info
  - Exploits Fused Data
- “Rapid Feature” Identification
- Land Cover Classification
- Change Detection
  
- *Intuitive User Interface*
- *Parallel/Scalable Implementation*
- *RCC Hardware Acceleration*

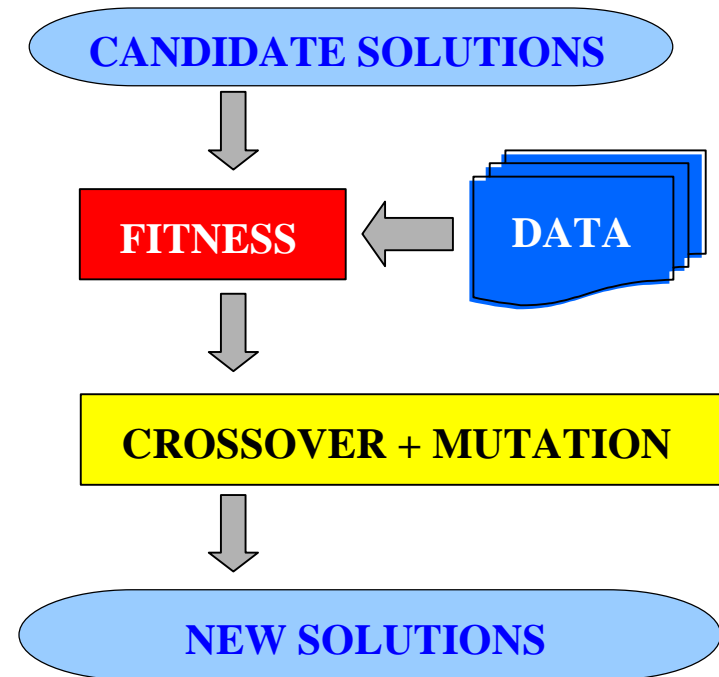
Los Alamos National Laboratory



# Evolution and the Genetic Algorithm



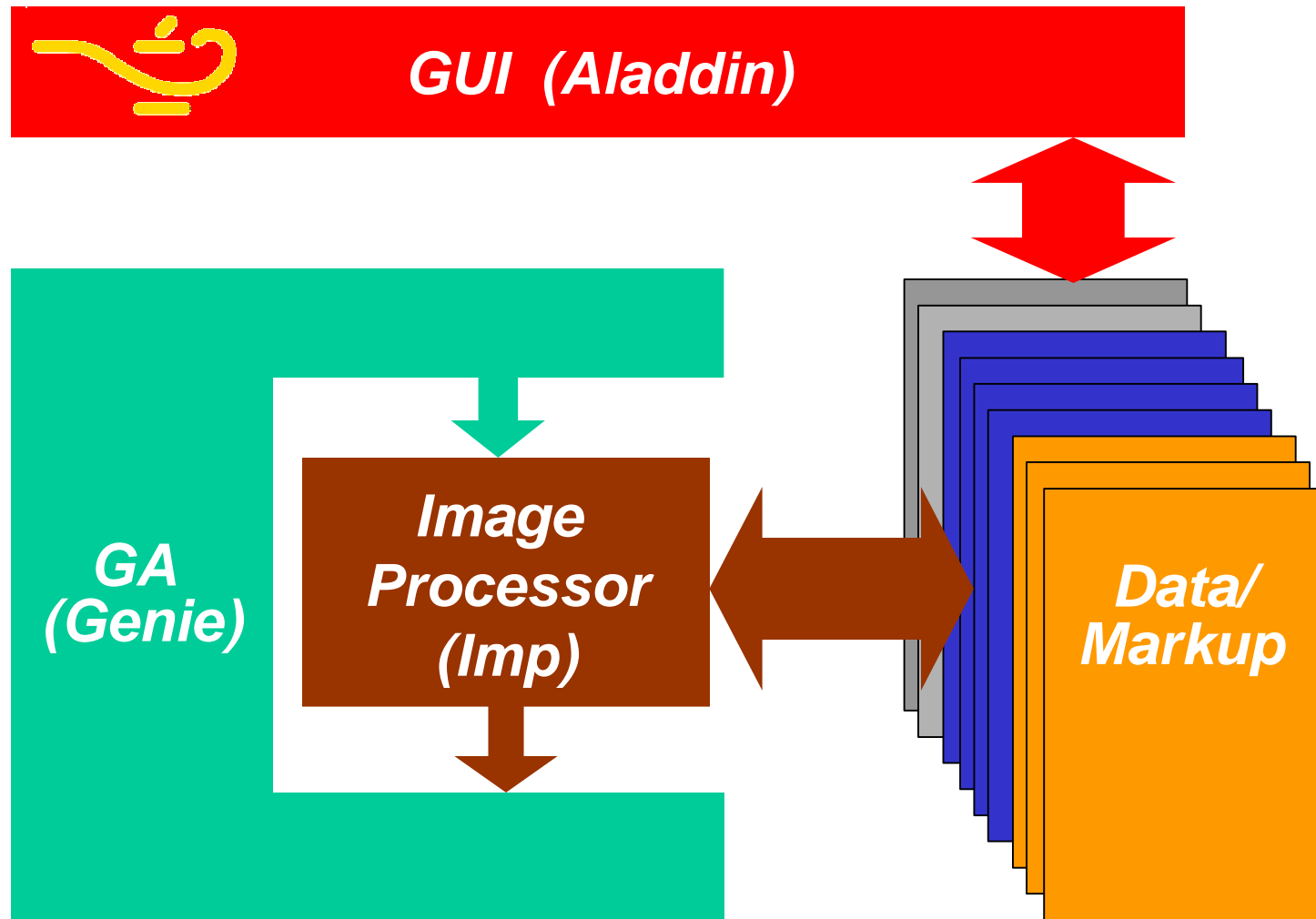
*A population evolves in response to the environment in which the fittest individuals survive.*



*The fittest solutions are those that produce results most consistent with the training data.*

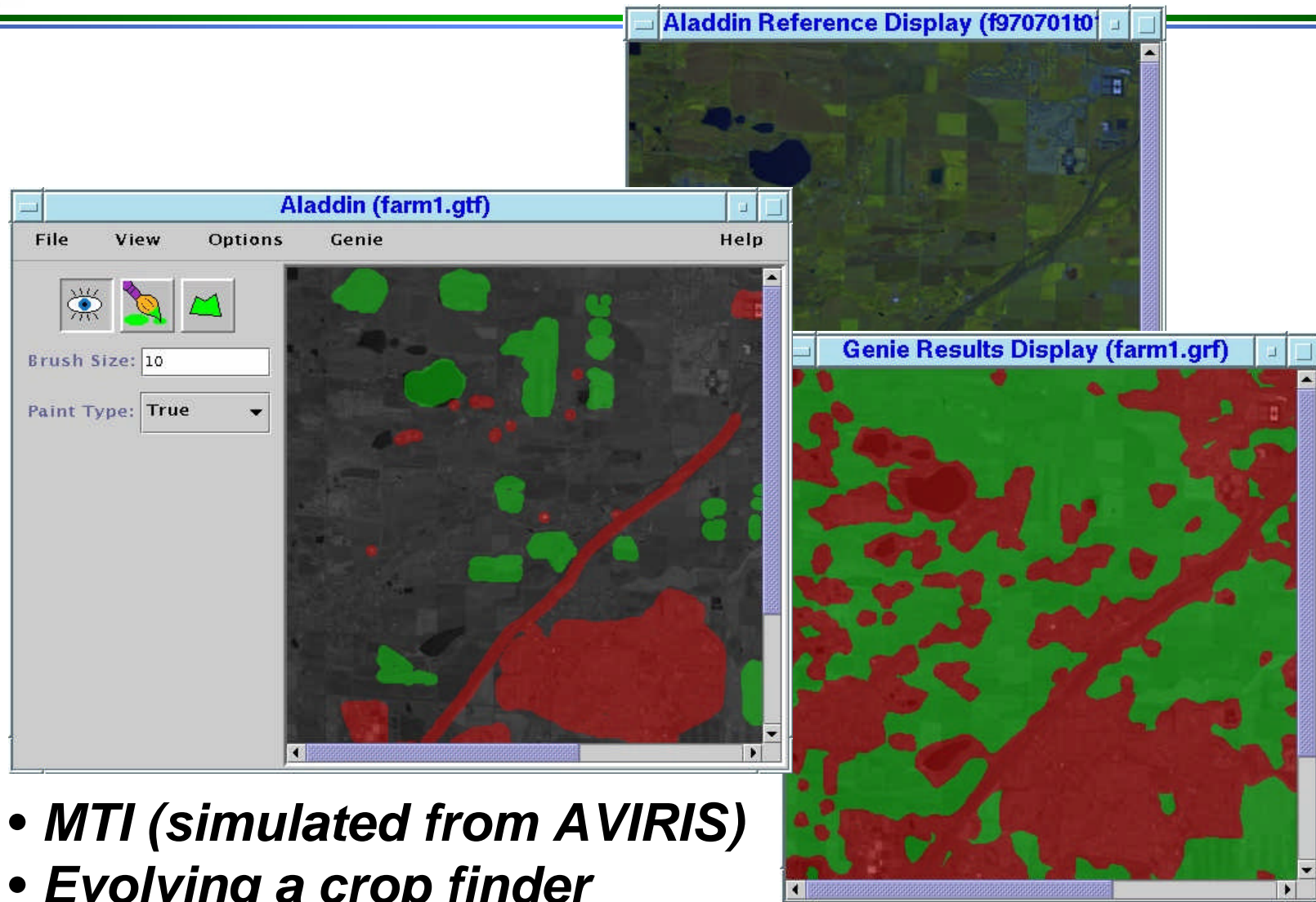


# Software Architecture





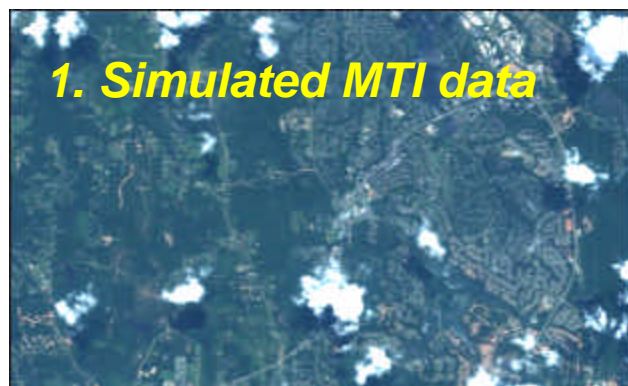
# Point-and-Click Training using Aladdin



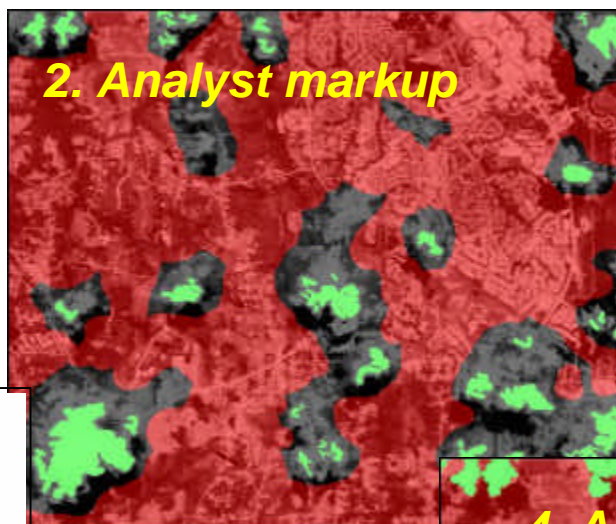
- *MTI (simulated from AVIRIS)*
- *Evolving a crop finder*



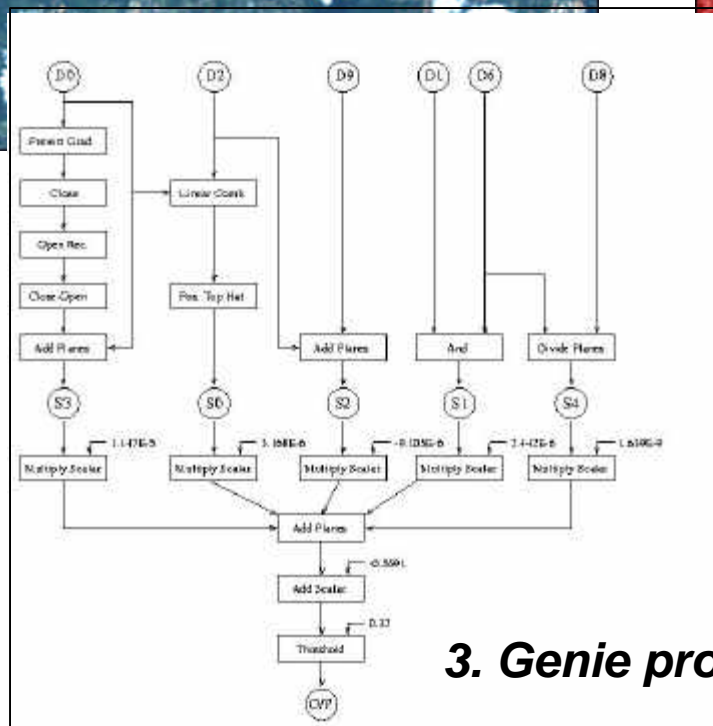
# ***Evolving a cloud mask***



**1. Simulated MTI data**



**2. Analyst markup**



**3. Genie produces a cloud mask finder**

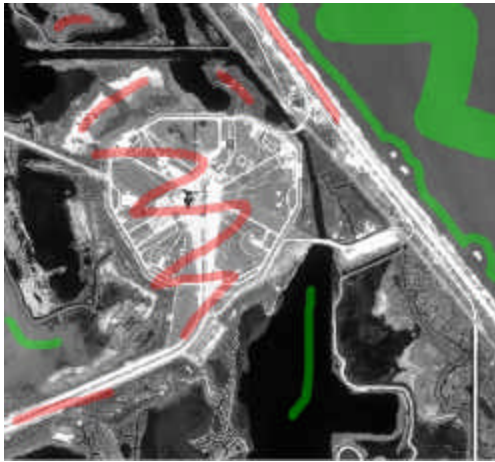


**4. Apply cloud mask**

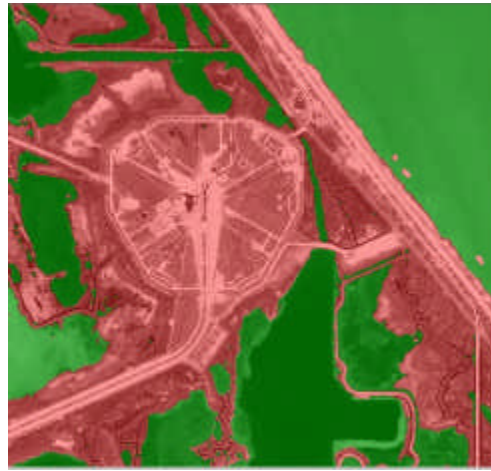




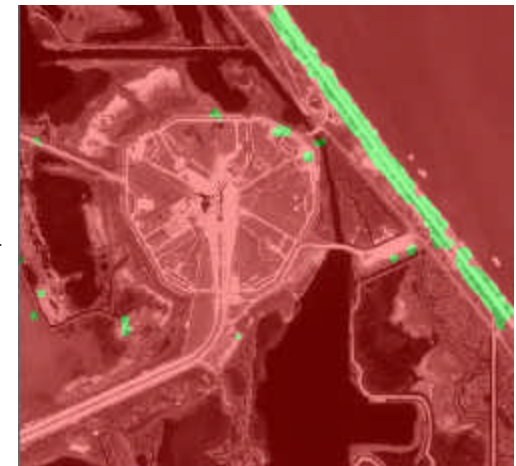
# Using water to find the beach



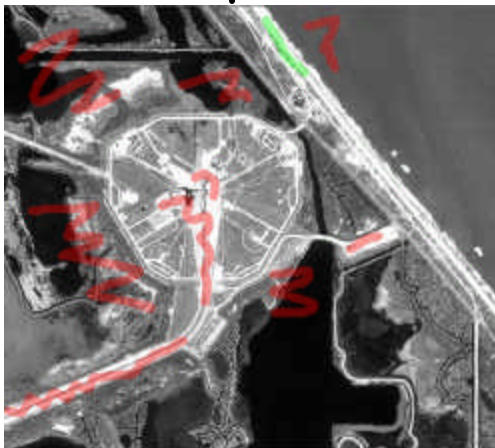
*Analyst marks up water*



*Water mask*



*Beach mask II  
Uses water mask as  
a pre-processed plane*



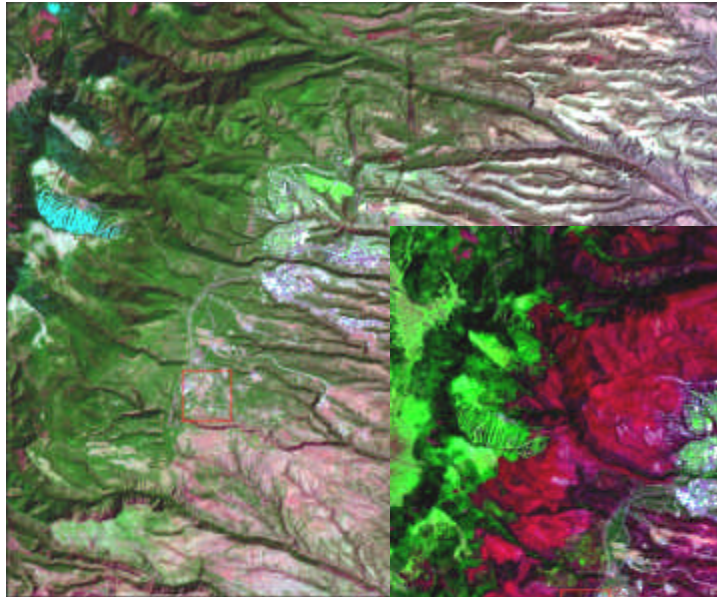
*Analyst marks up beach*



*Beach mask I*



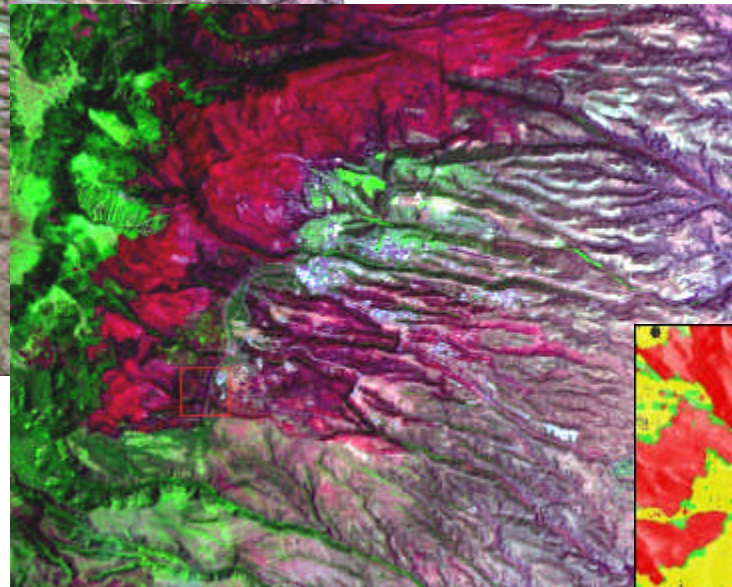
# ***Cerro Grande Fire: Before and After***



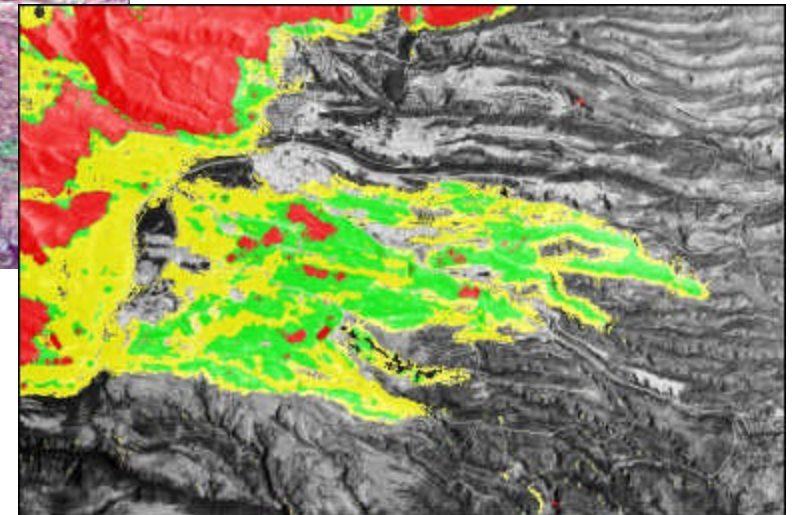
***April 14***

***NASA Landsat 7  
Multispectral Imagery  
Bands 7,4,3***

***July 19***



***Burn Severity Map  
based on Dadaelus MSI  
Informed aerial reseeding***

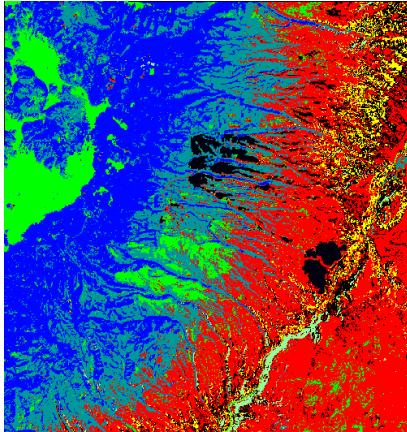


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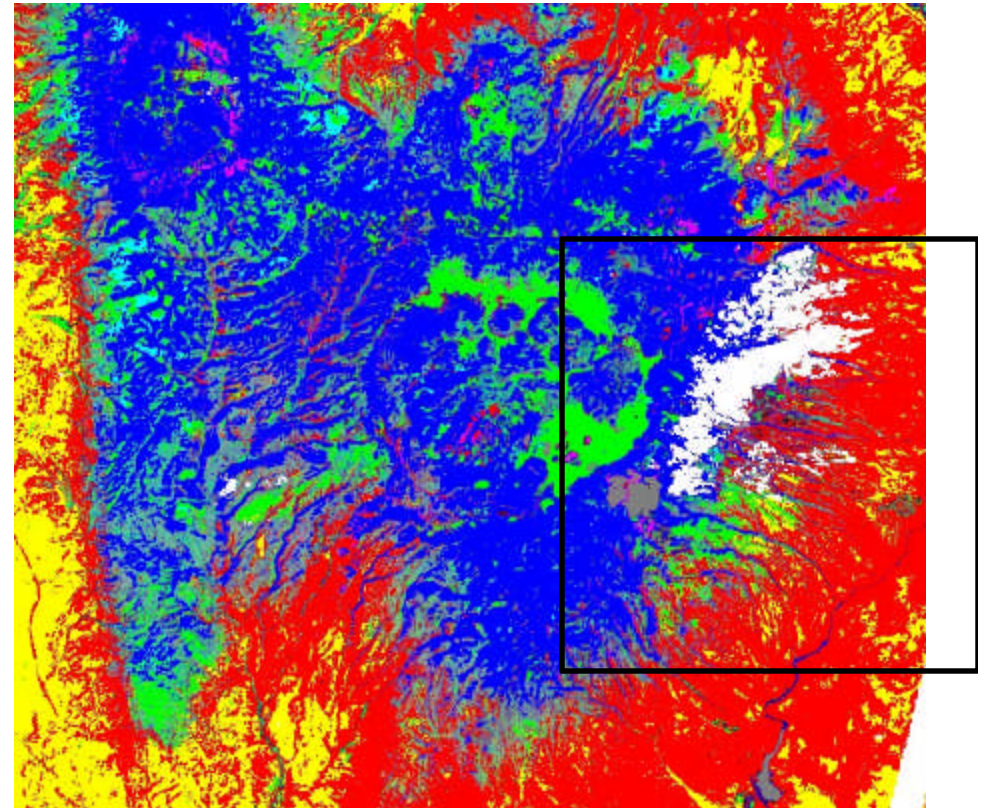


# Land Cover Classification



- **“Official” classification map, based on Ground truth from field excursions and Aug 1992, Landsat 5 TM data.**
- **Main Classes**
  - **Red: Pinon/Juniper**
  - **Green: Open grassland**
  - **Blue: Forest**
- **Townsites in black**

- **Genie classification map, based on post-fire, Landsat 7 ETM+ data**
- **Trained four classes**
  - **Red, Green, Blue: from official**
  - **White: Fire damage**
- **Covers much larger region**
- **Needed for Elk Habitat Study**







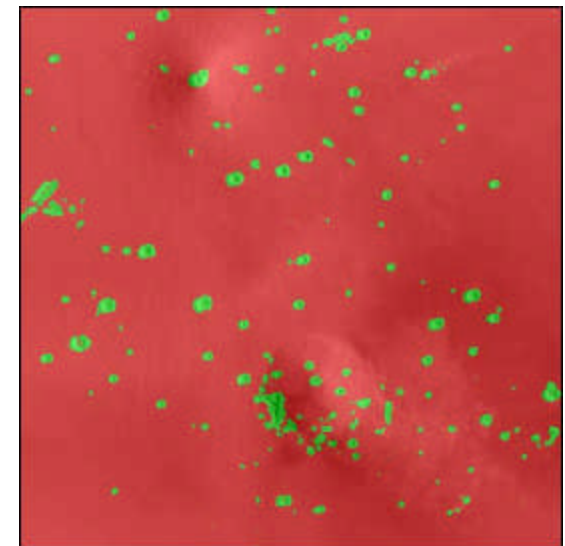
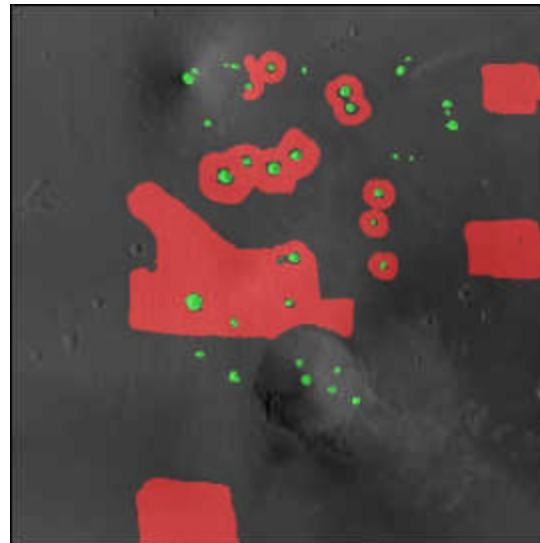
# *Training GENIE to find Craters on Mars*



*Mars Global Surveyor*



*Mars Orbital Camera  
Two channel (Red/Blue)  
100m resolution*

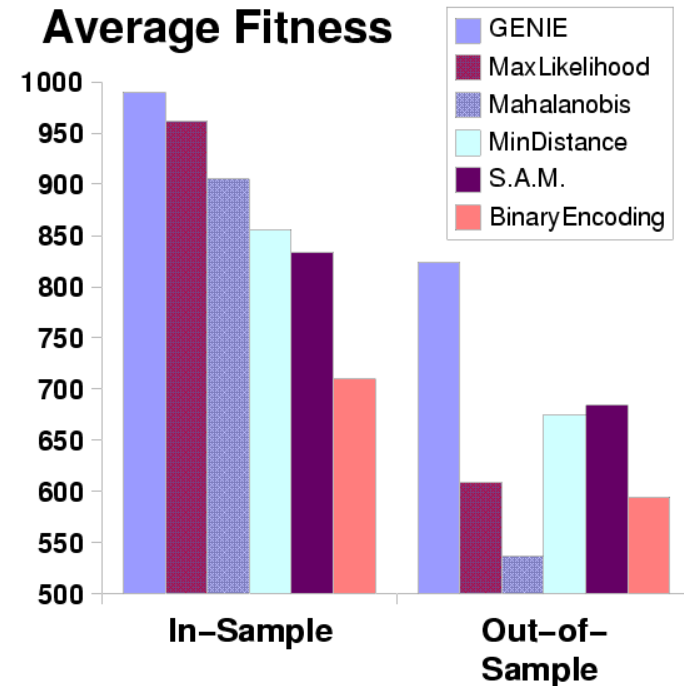




# ***GENIE vs Traditional Classifiers***



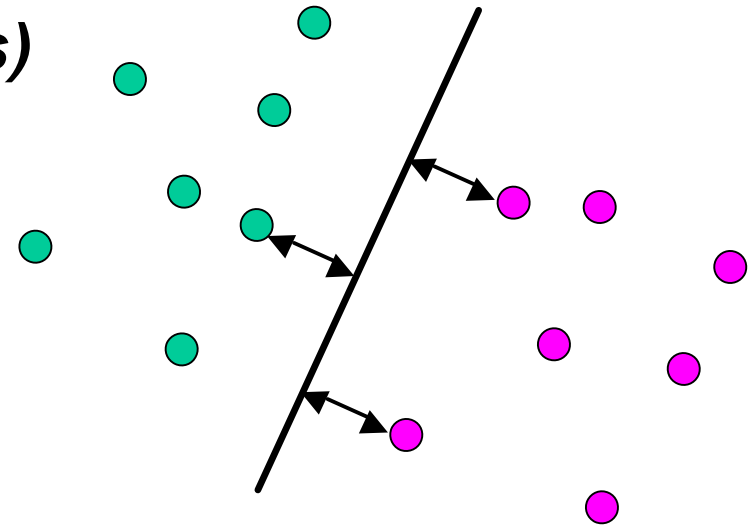
- **Classifiers Implemented in ENVI**
  - **Maximum Likelihood**
  - **Mahalanobis distance**
  - **Minimum distance**
  - **Spectral Angle Mapper**
  - **Binary Encoding**
- **Spectral vs Spatio-spectral**
- **One class vs Two class**
  - **true vs background**
  - **true vs false**
- **In-sample vs Out-of-sample**
  - **one set for training, two for testing**
- **Features: Roads, Clouds, Urban, Golf Courses**
- **Training time not shown...**





# ***Need for faster machine learning***

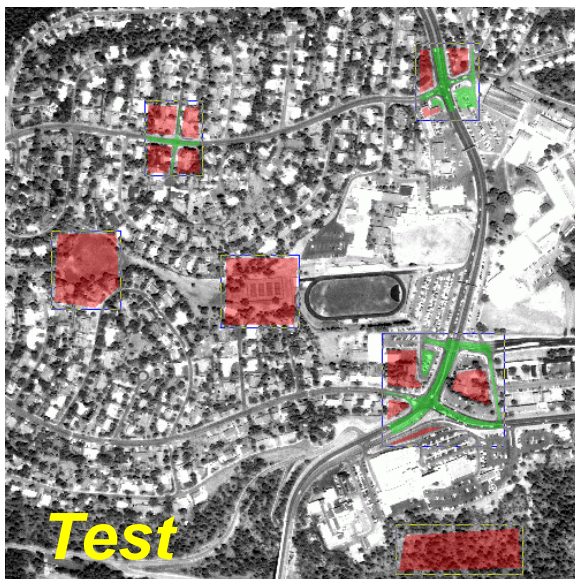
- ◆ ***Support Vector Machines (SVM's)***
  - ◆ ***Vapnik et al.***
- ◆ ***Empirically very successful***
- ◆ ***Can learn highly non-linear classifiers, but approach is to transform problem into one of linear separation.***
- ◆ ***Mathematically well-founded***
  - ◆ ***Maximizing the “margin” prevents overfitting***
  - ◆ ***Avoids the “curse of dimensionality”***
- ◆ ***Afreet***
  - ◆ ***implements SVM's for multispectral imagery***



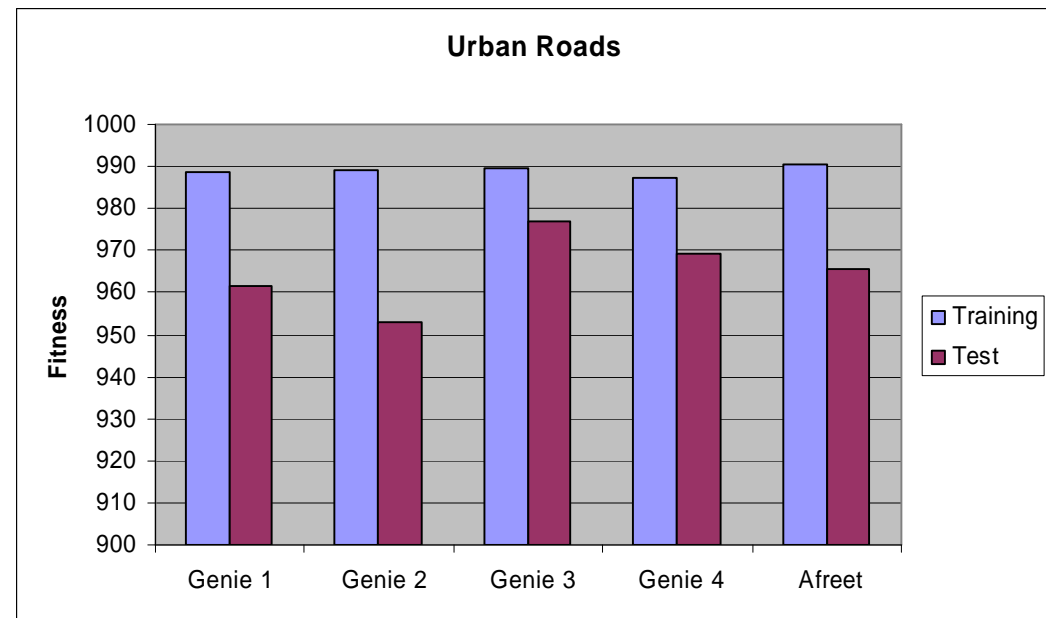




# Genie vs Afreet: Urban Roads



- *Aladdin provides training and test data*
- *Genie runs took ~10 hours of compute time each*
  - *2000 evaluations (stopping condition arbitrary)*
- *Afreet training takes ~40 seconds*
  - *but sometimes longer...*
  - *auxiliary spatial planes must be supplied*
- *Afreet II*
  - *automatic feature selection*





# GENIE in Hardware



## Configurable Pipeline for Feature Extraction

### Pipeline Complexity

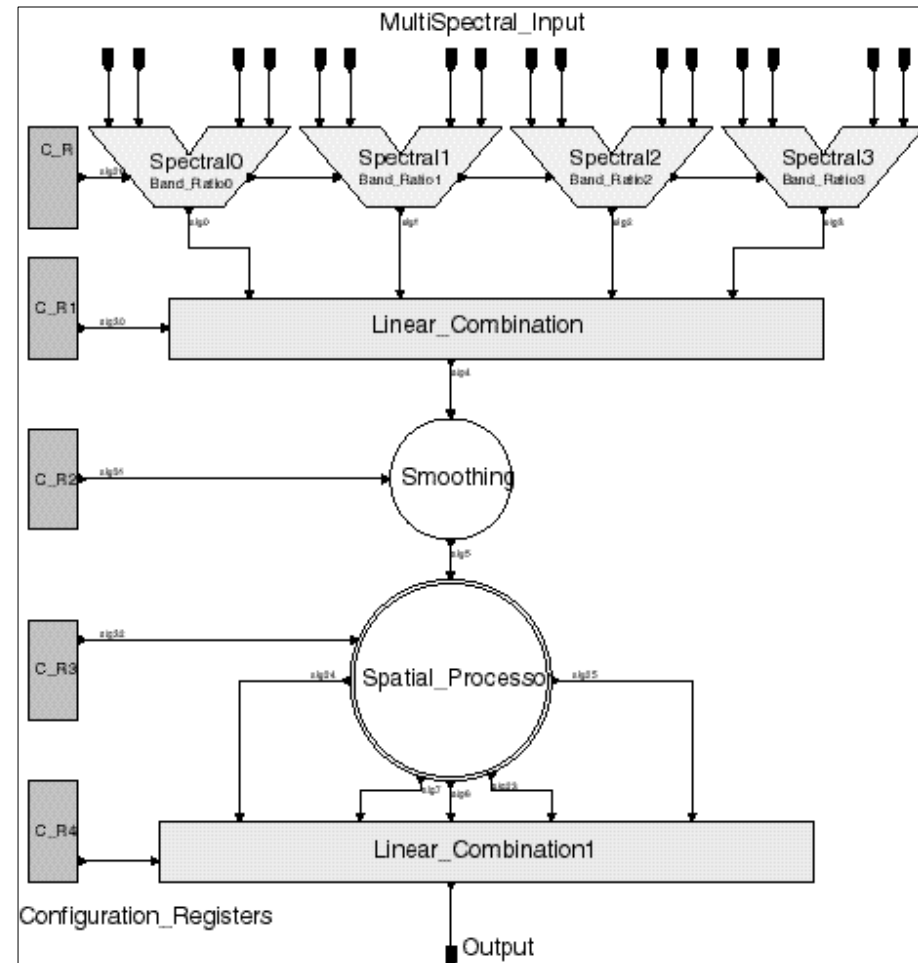
- 4 Band Ratios
- Linear Combination
- 5x5 Spatial Smoothing
- 9x9 Spatial Statistics/Morphology
- Linear Combination
- Threshold (at 0)
- Distance calculation to training data

### Run-Time Reconfiguration

- Four 32 bit on-chip registers store pipeline configuration
- ~ 6us to program (Wildcard PCMCIA)

### Pipeline Evaluation Time

- ~2.3 ms at 30MHz for 256x256 images





# Hardware Genie: Road Finder Result



Results for 2 test images (IKONOS)



- **Hardware Simulation**

- **Training time: ~ 85 seconds**
- **Training score: 956/1000**
- **Testing score: 960/1000**



- **Software Experiment**

- **Training time: > 6 hours**
- **Training score: 954/1000**
- **Testing score: 954/1000**